

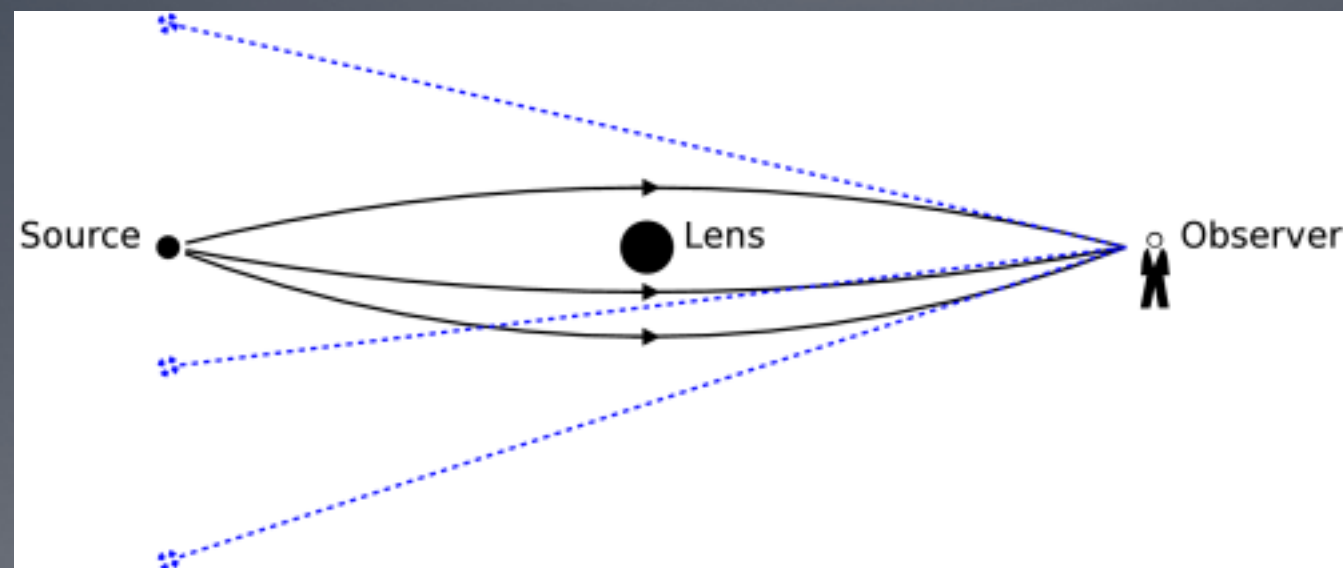
# Instrumental systematics and weak lensing science

Rachel Mandelbaum (CMU)  
PACCD, Dec. 4, 2014

# Outline

- Weak gravitational lensing
  - What is it?
  - Why should you care?
- How lensing measurements work
- How systematics (including instrumental ones) affect weak lensing measurements

# Gravitational lensing



Strong lensing

Sensitive to all matter  
along line of sight,  
including dark matter!



# More generally...

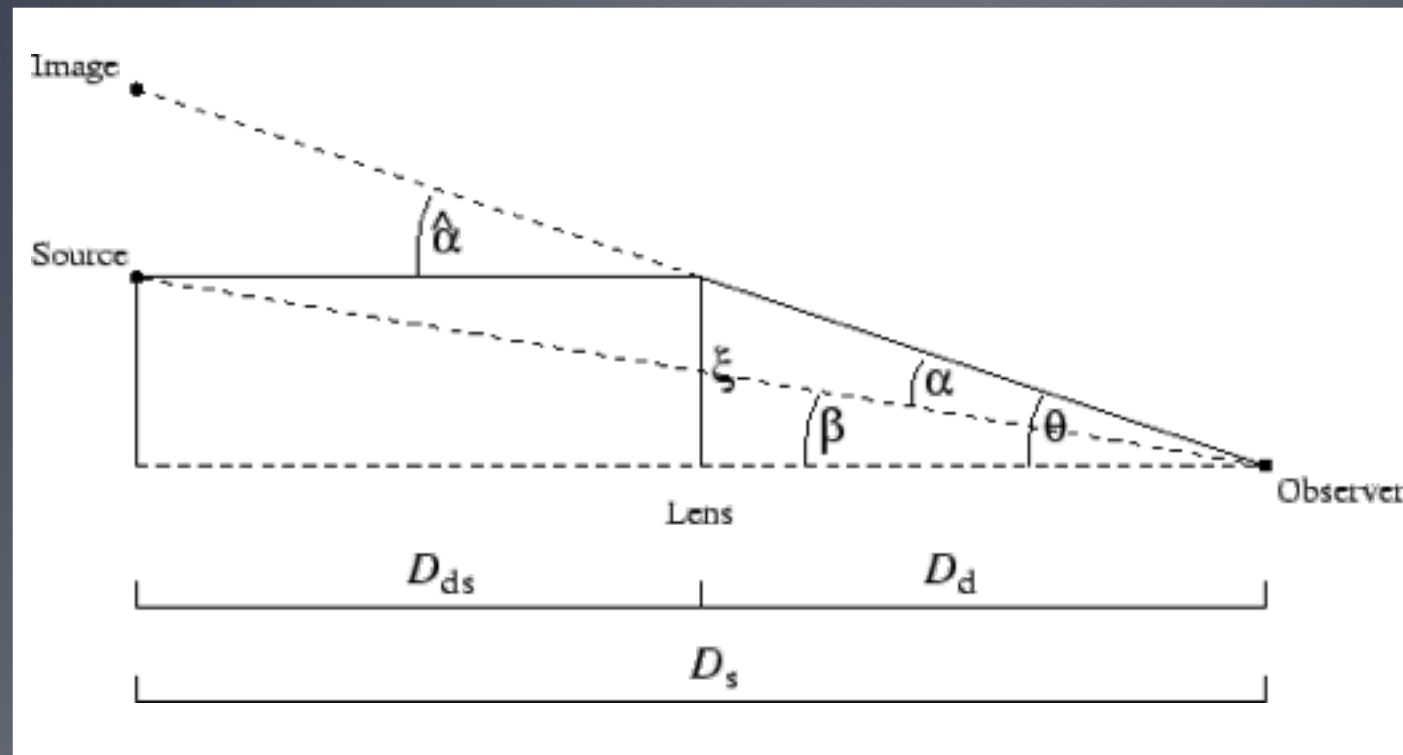
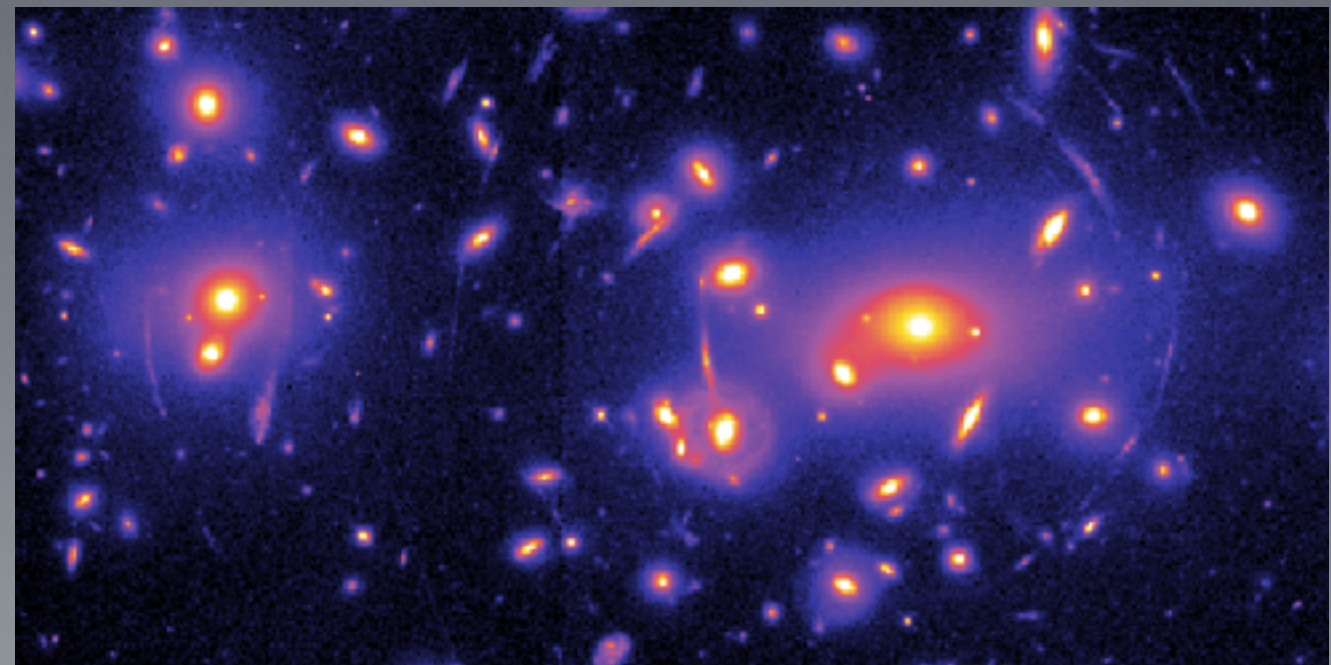


Diagram from  
Narayan &  
Bartelmann  
(1997)

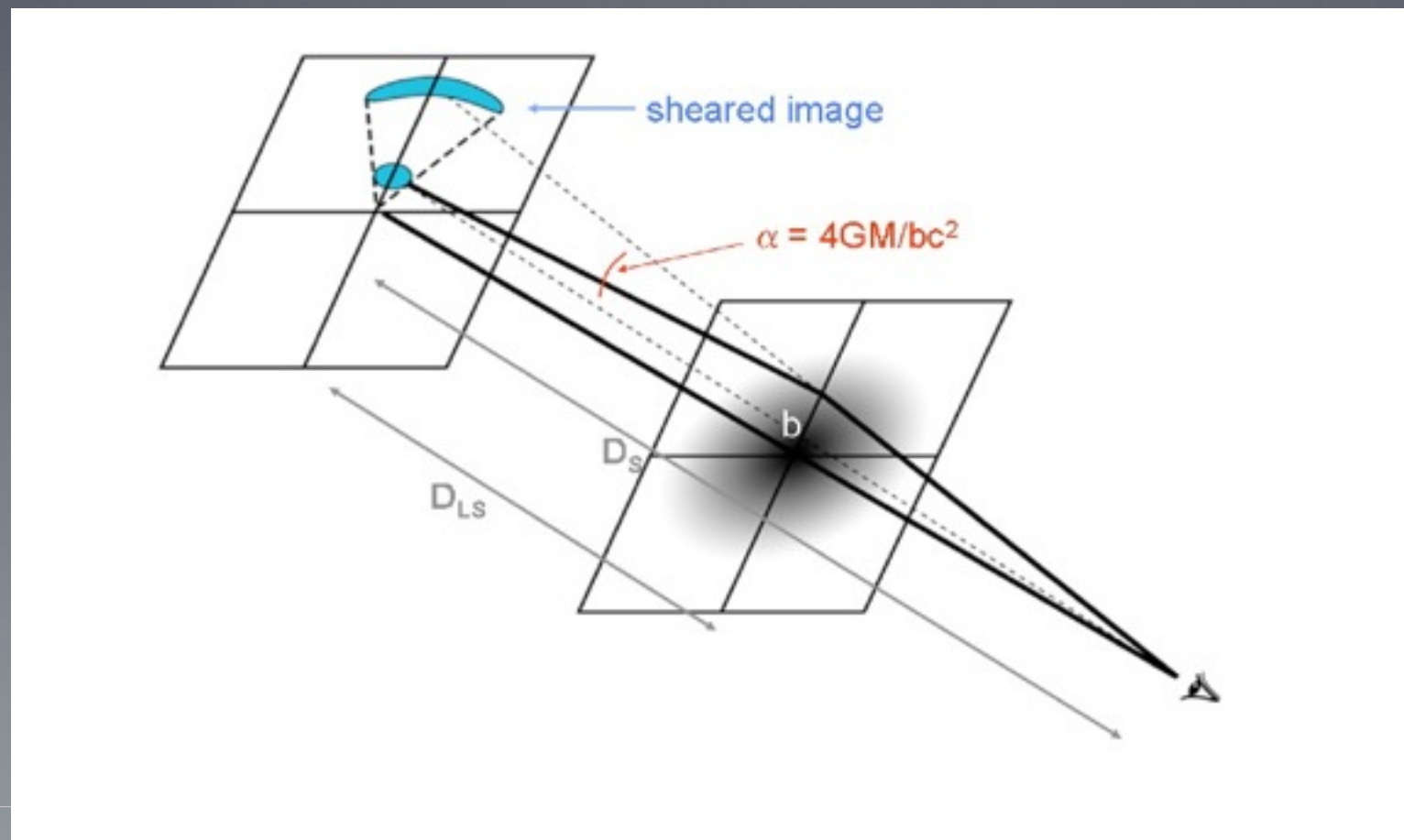
$$\hat{\alpha} = \frac{4G}{c^2} \frac{M(< \xi)}{\xi}$$



Credit:  
Couch &  
Ellis /  
NASA

# Weak lensing

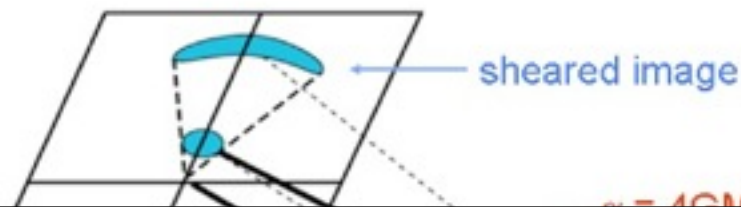
- Very small deflection angles
- Coherent statistical distortion (shear,  $\gamma$ ) of galaxy shapes
- Does not require chance superposition like strong lensing



Picture credit:  
LSST Science  
Book

# Weak lensing

- Very small deflection angles
- Coherent statistical distortion (shear,  $\gamma$ ) of galaxy shapes
- Does not require chance superposition like strong lensing



Lensing depends on:

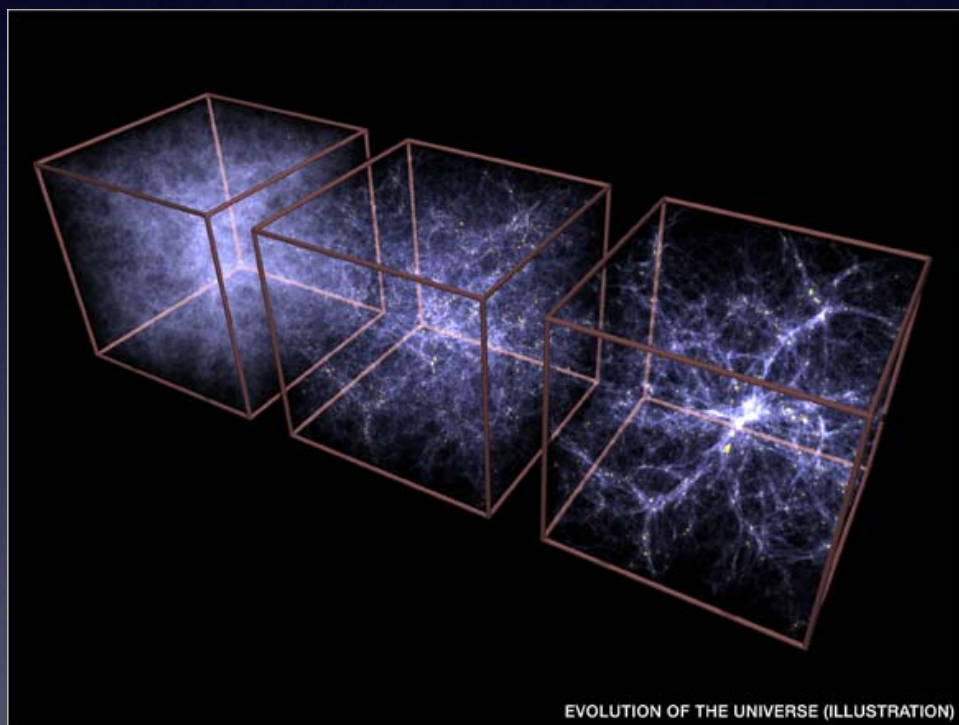
- Enclosed mass
- Distance from that mass
- “Lensing kernel”: distances to lens and source

Picture credit:  
LSST Science  
Book

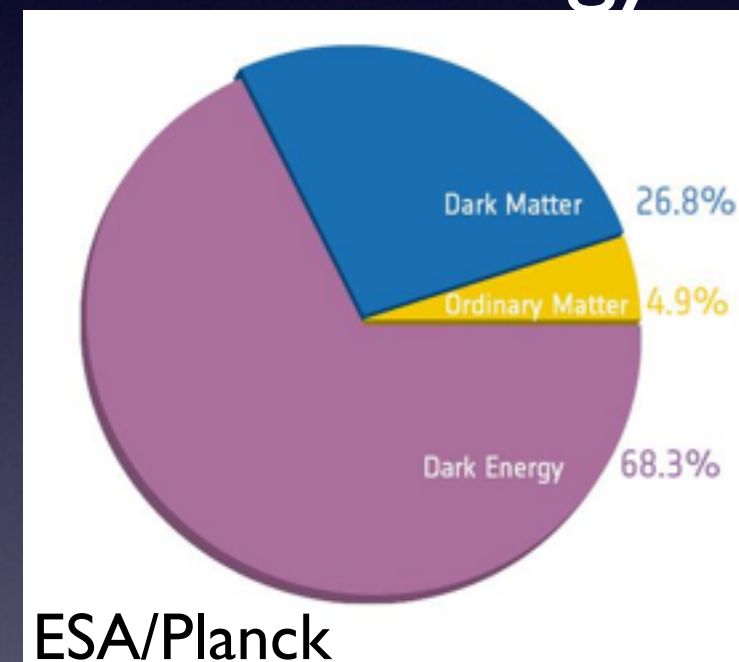


# Why should you care about weak lensing?

Structure growth!



Dark matter and dark energy!



Theory of gravity!

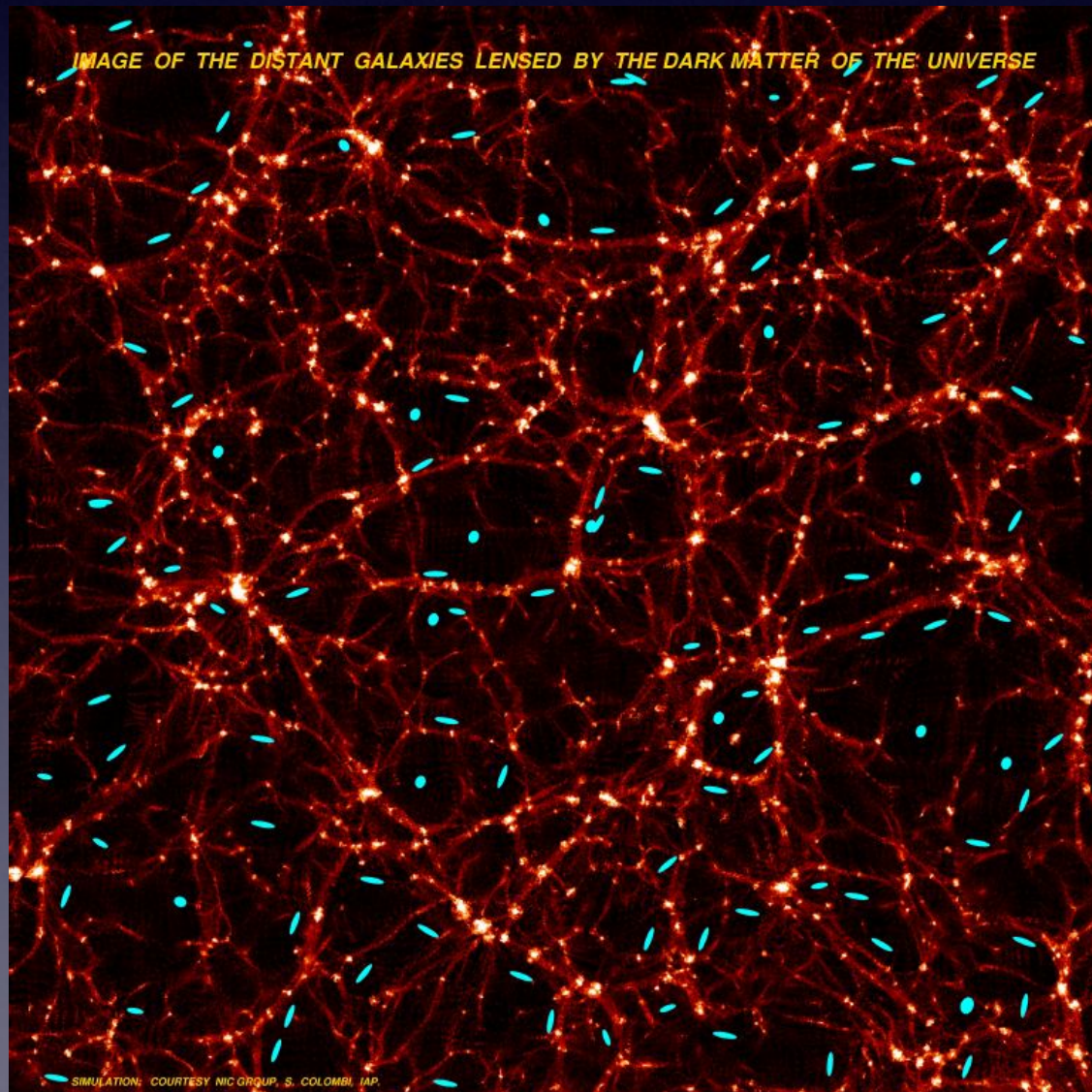
$$R_{\mu\nu} - \frac{1}{2}Rg_{\mu\nu} = 8\pi GT_{\mu\nu}$$



Galaxy-dark matter connection!

# So how does this work?

Cosmic shear:  
weak lensing by large-scale structure



Requires catalogs with:

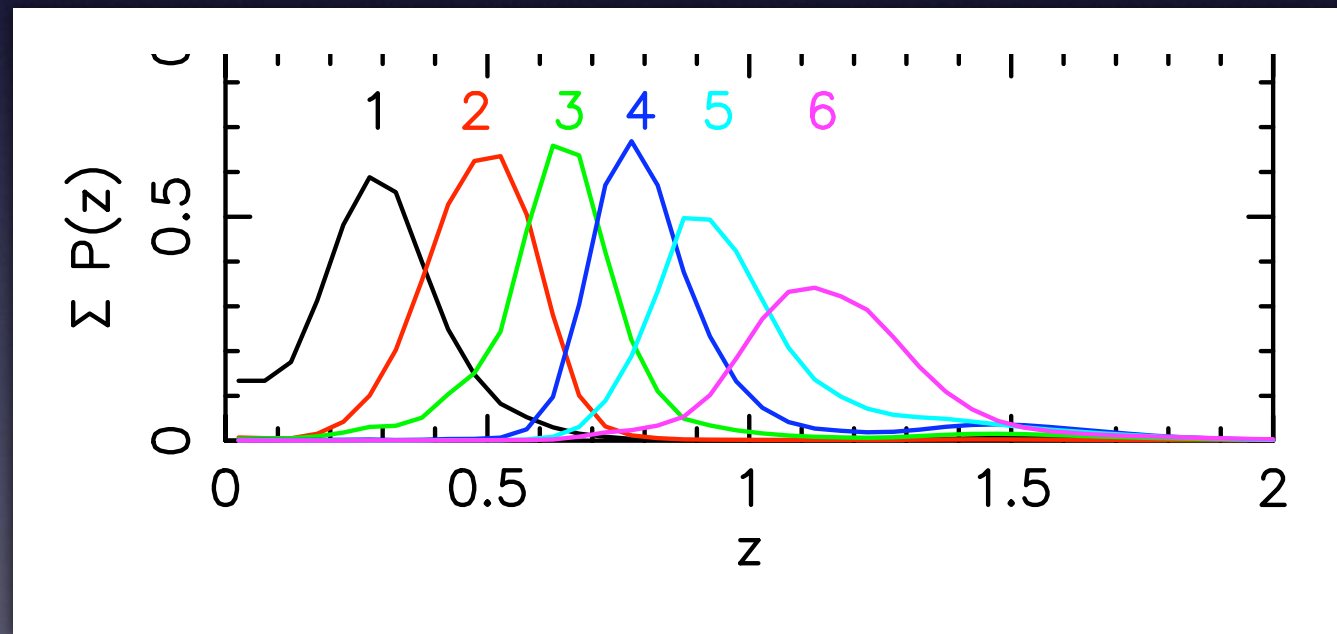
1. Galaxy positions
2. Galaxy shear estimates (maybe?)

And an estimate of  $dN/dz$ .



# So how does this work?

Cosmic shear:  
weak lensing by large-scale structure



Heymans et al. (2013)  
CFHTLenS

Tomography requires catalogs with:

1. Galaxy positions
2. Galaxy shear estimates
3. Galaxy redshift estimates (photo- $z$  or  $p(z)$ )

# So how does this work?

Cosmic shear:  
weak lensing by large-scale structure

$$\hat{\xi}_{\pm}^{ij}(\theta) = \frac{\sum w_a w_b [\epsilon_t^i(\mathbf{x}_a) \epsilon_t^j(\mathbf{x}_b) \pm \epsilon_{\times}^i(\mathbf{x}_a) \epsilon_{\times}^j(\mathbf{x}_b)]}{\sum w_a w_b}$$

Tomography requires catalogs with:

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# So how does this work?

Cosmic shear:  
weak lensing by large-scale structure

Indices of z bins      Separation on the sky

$$\hat{\xi}_{\pm}^{ij}(\theta) = \frac{\sum w_a w_b [\epsilon_t^i(\mathbf{x}_a) \epsilon_t^j(\mathbf{x}_b) \pm \epsilon_{\times}^i(\mathbf{x}_a) \epsilon_{\times}^j(\mathbf{x}_b)]}{\sum w_a w_b}$$

Shear correlation functions

Tomography requires catalogs with:

1. Galaxy positions
2. Galaxy shear estimates
3. Galaxy redshift estimates (photo-z or p(z))



# So how does this work?

Cosmic shear:  
weak lensing by large-scale structure

shears in coordinate system  
aligned with vector connecting galaxy pair

$$\hat{\xi}_{\pm}^{ij}(\theta) = \frac{\sum w_a w_b [\epsilon_t^i(\mathbf{x}_a) \epsilon_t^j(\mathbf{x}_b) \pm \epsilon_{\times}^i(\mathbf{x}_a) \epsilon_{\times}^j(\mathbf{x}_b)]}{\sum w_a w_b}$$

galaxy positions

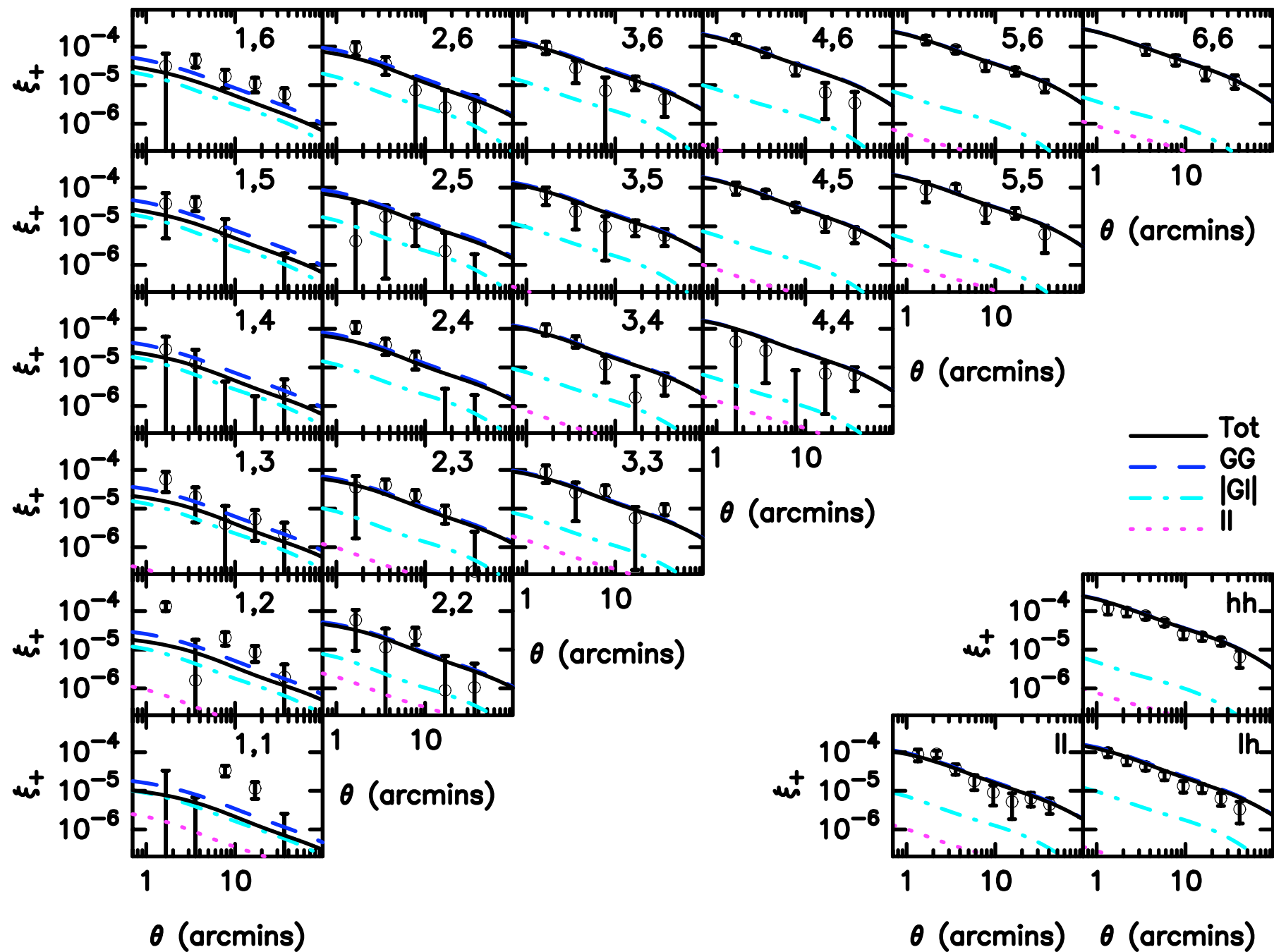
weight factors

Tomography requires catalogs with:

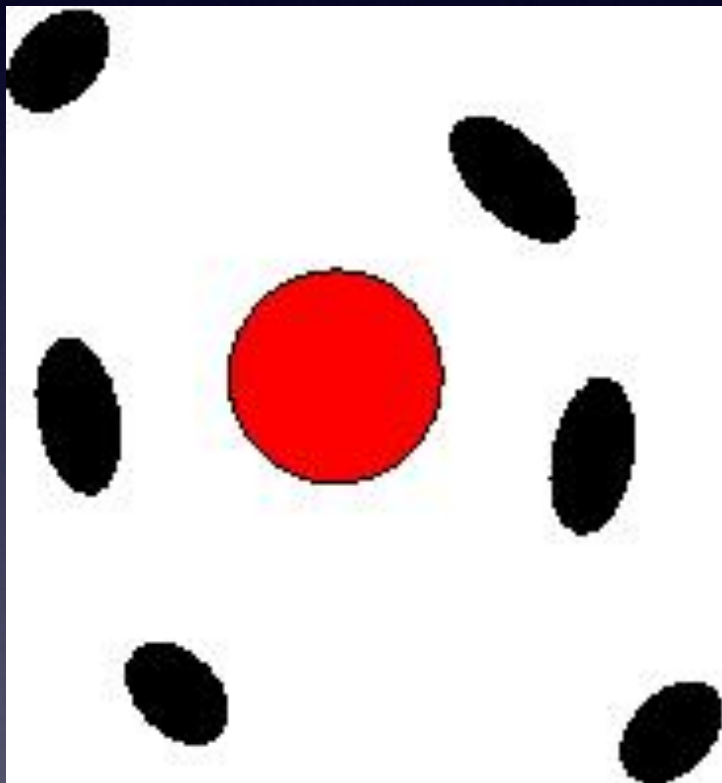
1. Galaxy positions
2. Galaxy shear estimates
3. Galaxy redshift estimates (photo-z or p(z))

# e.g., in CFHTLenS

(Heymans et al. 2013)



# Another option: galaxy-galaxy or cluster-galaxy lensing

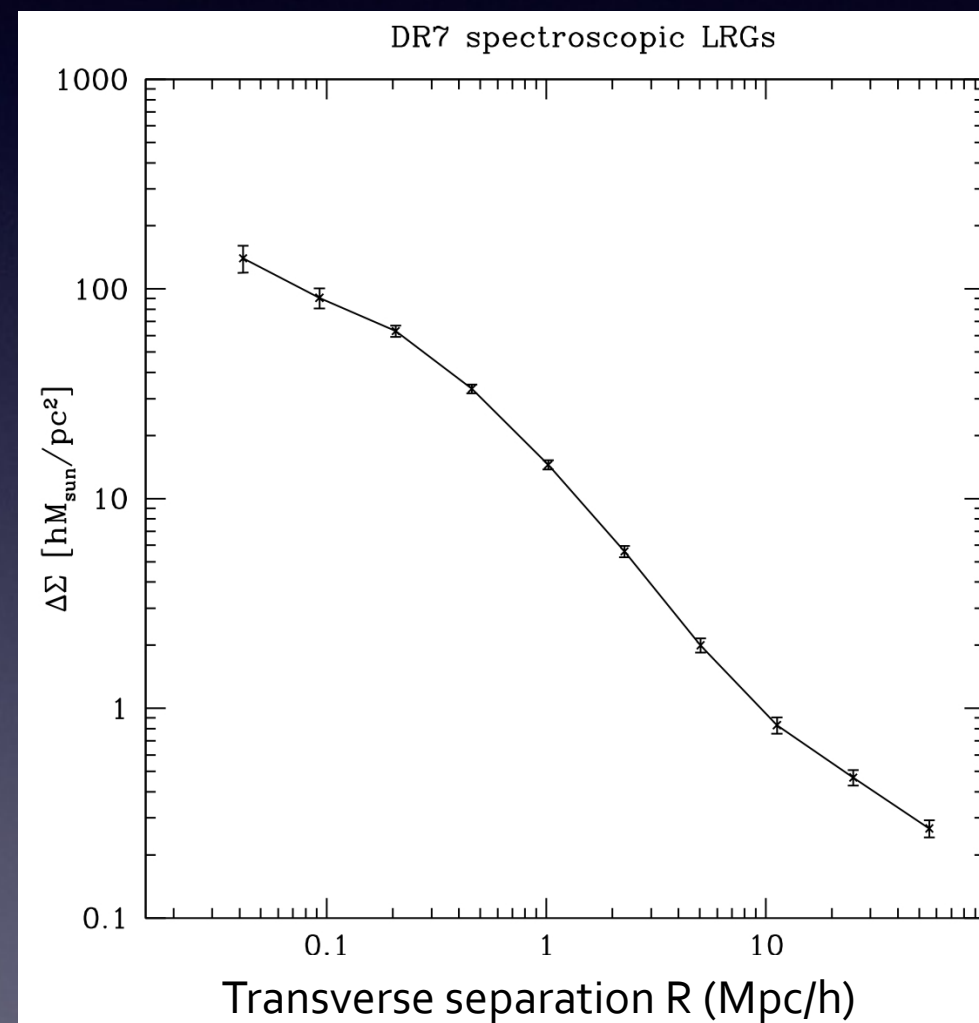


Requires catalogs with:

1. Background galaxy positions, shear estimates, redshift estimates
2. A sample of foreground masses



# Another option: galaxy-galaxy or cluster-galaxy lensing

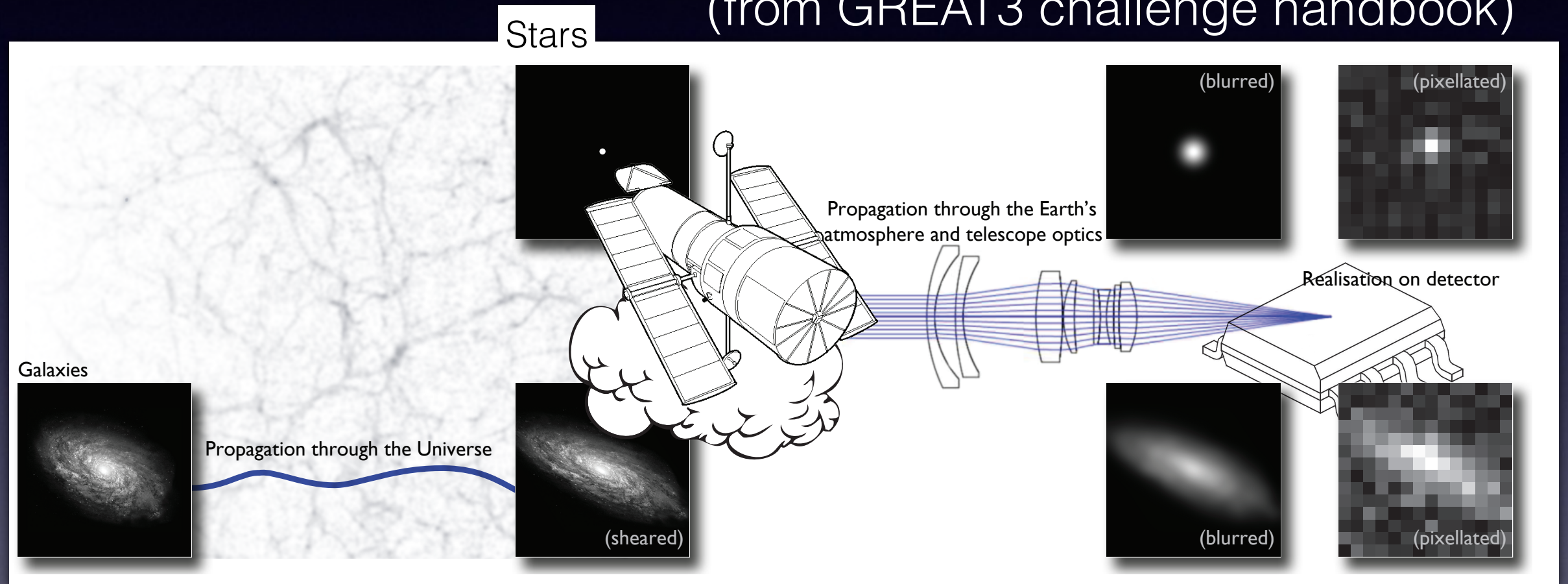


Mass profiles of  
massive galaxies,  
including large-  
scale structure

(RM et al. 2013)

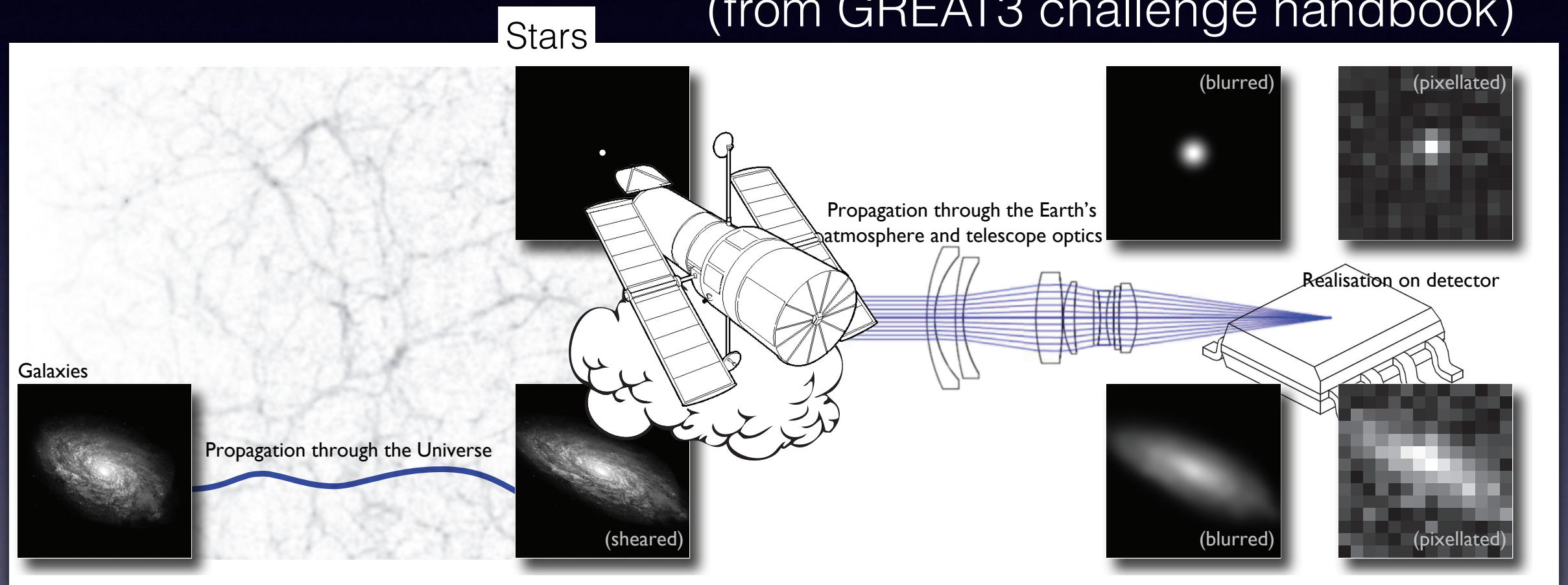
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(from GREAT3 challenge handbook)



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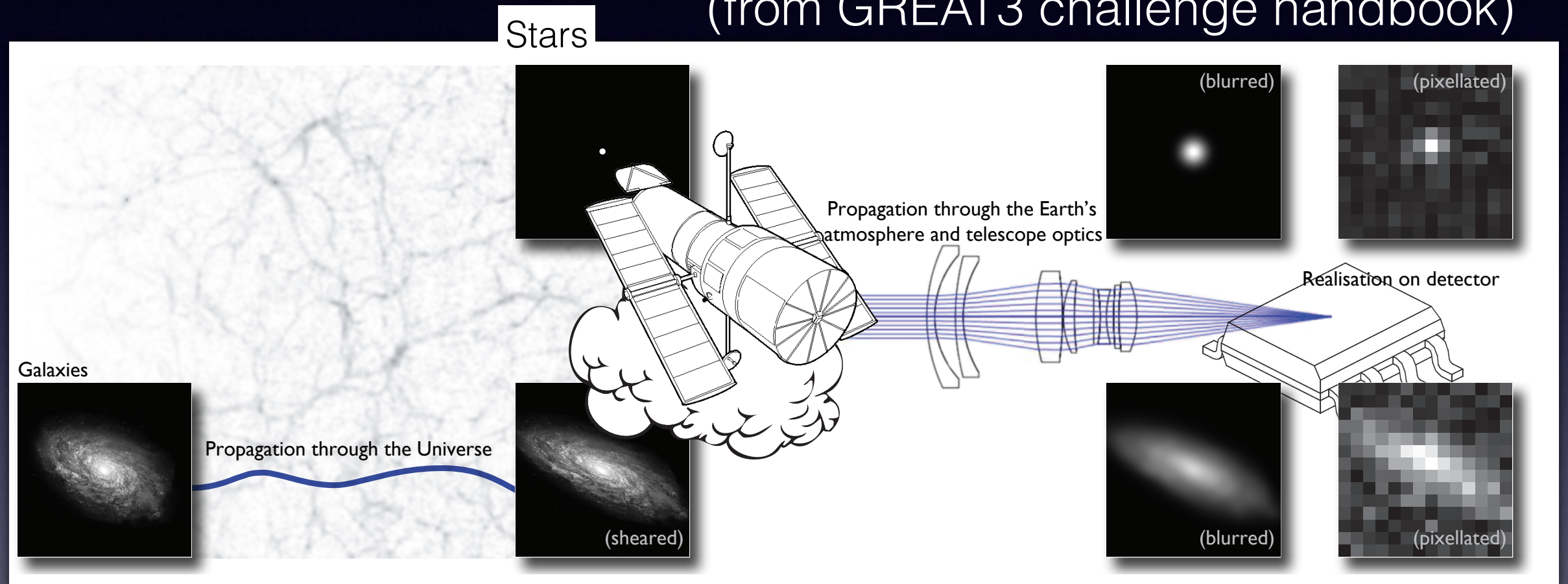


To estimate the shear, we have to measure galaxy image properties, and *estimate and remove* the PSF



# Where do systematics come in?

(from GREAT3 challenge handbook)



To estimate the shear, we have to  
measure galaxy image properties, and  
*estimate* and ~~remove~~ the PSF

# Examples of where systematics come in

- Chromatic effects: PSF for stars is different from that for galaxies, or even within different parts of the same galaxy.
- Brighter-fatter effect: PSF for bright stars is fatter than that for the galaxies.
- Tree rings, edge distortion: astrometry (a remapping that isn't a convolution)
- Cosmic rays: basic measurement issue
- Defects can lead to coherent selection effects

# The connection to science

Model errors in shapes as a multiplicative bias, additive term:

$$Y_{\text{meas}} = (1+m) Y_{\text{true}} + c$$

(Ideally  $m=c=0$ )



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Model errors in shapes as a multiplicative bias, additive term:

$$\gamma_{\text{meas}} = (1+m) \gamma_{\text{true}} + c$$

(Ideally  $m=c=0$ )

Galaxy-galaxy lensing (shear-position correlation):

$$\langle g \gamma_{\text{meas}} \rangle = (1+m) \langle g \gamma_{\text{true}} \rangle + \langle g c \rangle$$

↑  
Calibration bias

↑  
Additive term (often removable)

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Model errors in shapes as a multiplicative bias, additive term:

$$\gamma_{\text{meas}} = (1+m) \gamma_{\text{true}} + c$$

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Cosmic shear (shear-shear correlation):

$$\langle \gamma_{\text{meas}} \gamma_{\text{meas}} \rangle = (1+m)^2 \langle \gamma_{\text{true}} \gamma_{\text{true}} \rangle + 2(1+m) \langle c \gamma_{\text{true}} \rangle + \langle c c \rangle$$

↑  
Calibration bias

↖ ↗  
Additive term  
(diagnosable with star-galaxy  
cross-correlations)



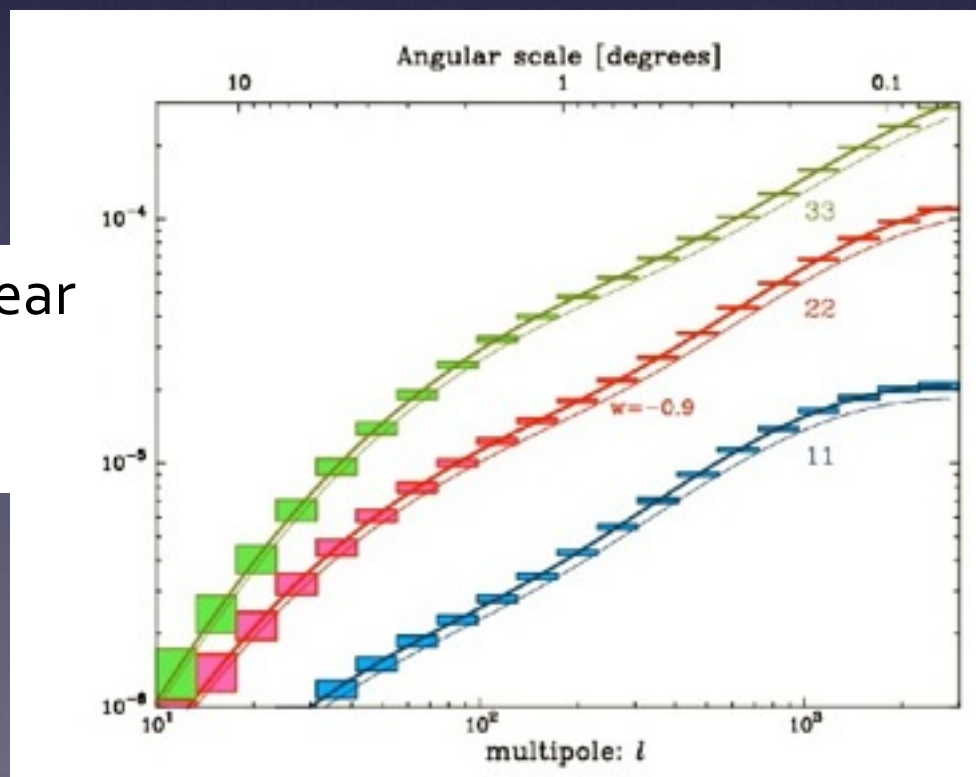
# The connection to science

Model errors in shapes as a multiplicative bias, additive term:

$$\gamma_{\text{meas}} = (1+m) \gamma_{\text{true}} + c$$

(Ideally  $m=c=0$ )

Cosmic shear  
power  
spectrum

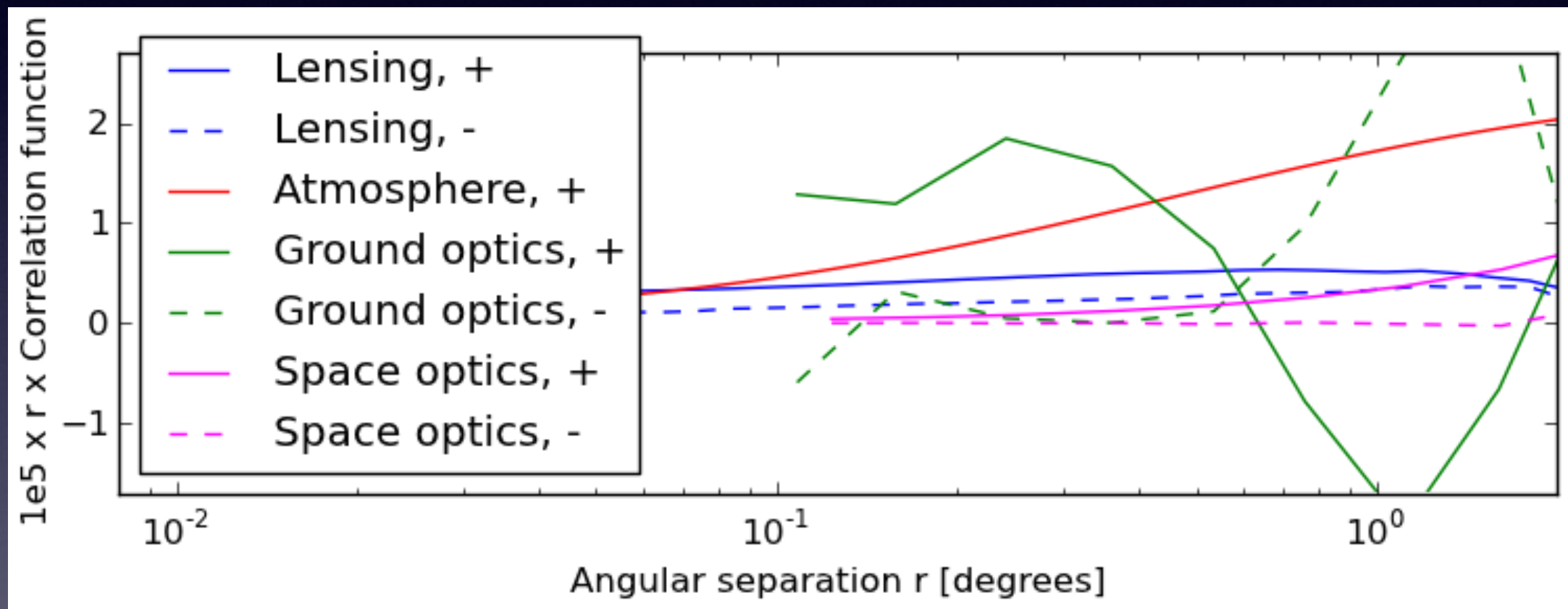


Important note:  
usually  $m = m(\text{S/N, size, ...}) = m(z)$ , effectively

and same for  $c$

Picture credit: LSST science book

# The connection to science



(from GREAT3 handbook)

# Examples of instrumental effects

Brighter-fatter effect:

- If PSF size is wrong by 1%...
- For typical shear estimation methods and moderately-resolved galaxies, shear estimates will be wrong by 1%
- Worse for smaller galaxies

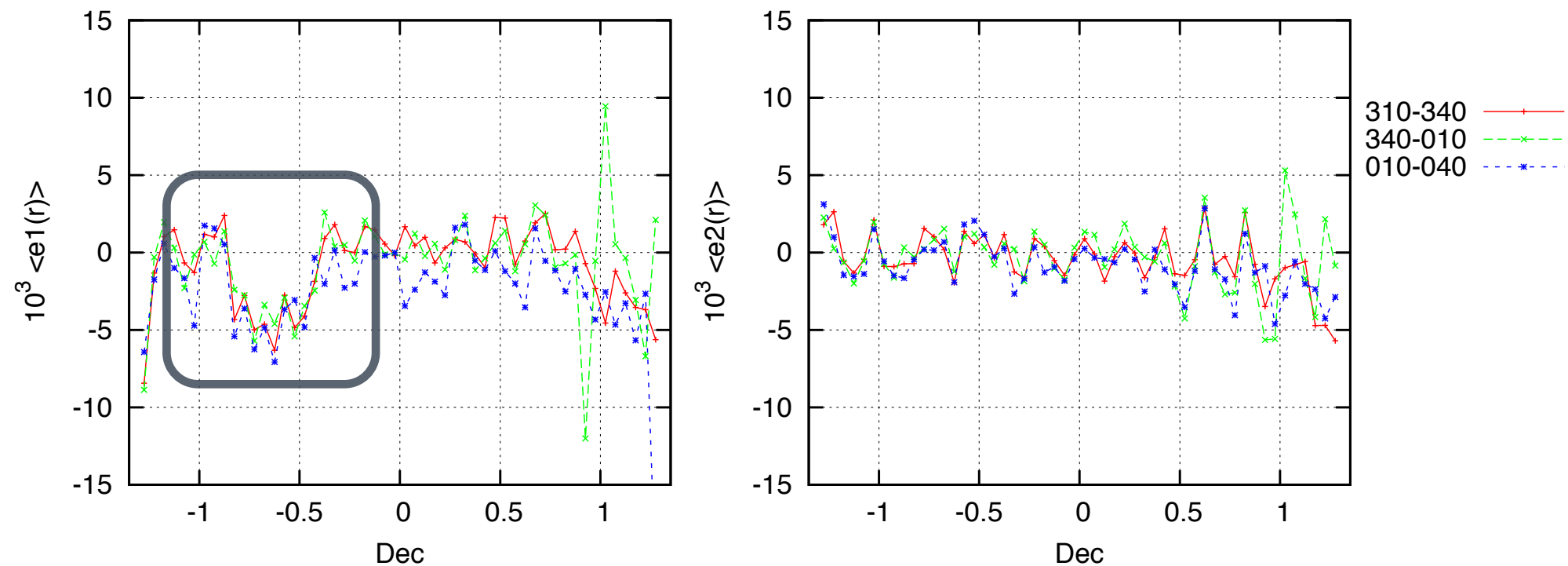


# Examples of instrumental effects

## Brighter-fatter effect:

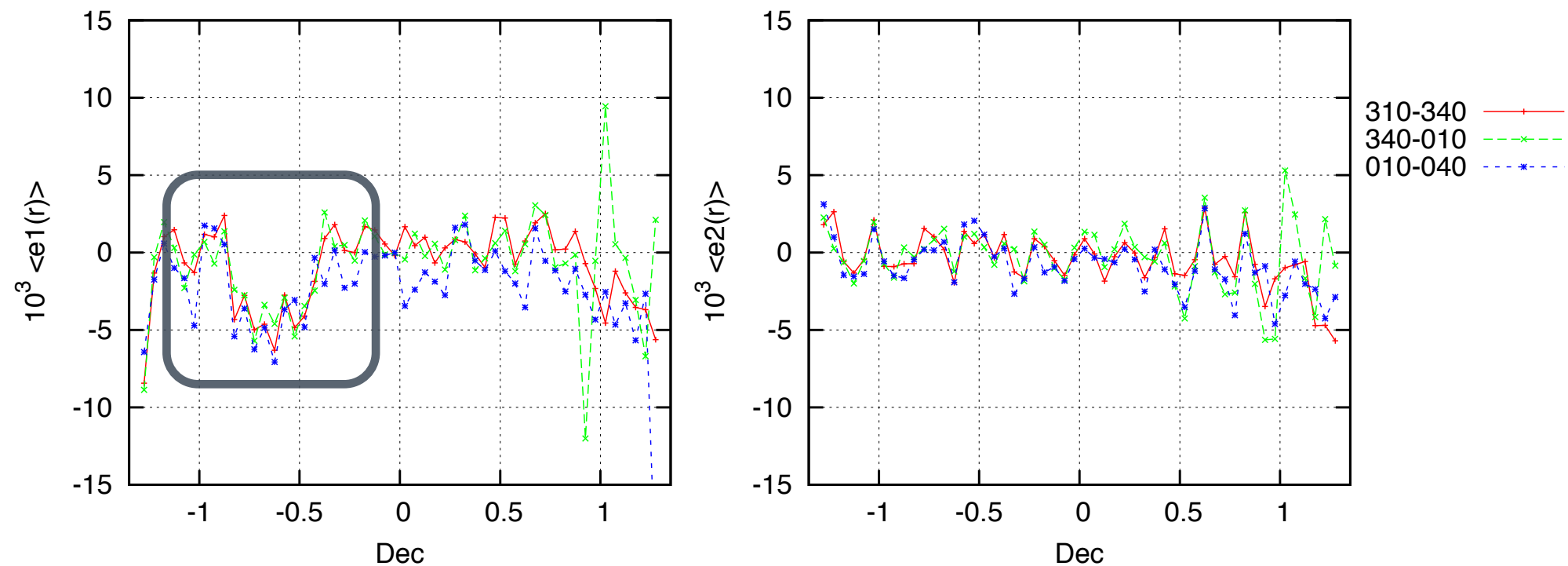
- If PSF ellipticity is wrong by 0.01 (coherently)...
- For typical shear estimation methods, ~a few % of this will leak into the galaxy shapes, giving coherent shear of  $\text{few} \times 10^{-4}$
- Worse for smaller galaxies

# Examples of instrumental effects



Huff et al. (2014)

# Examples of instrumental effects

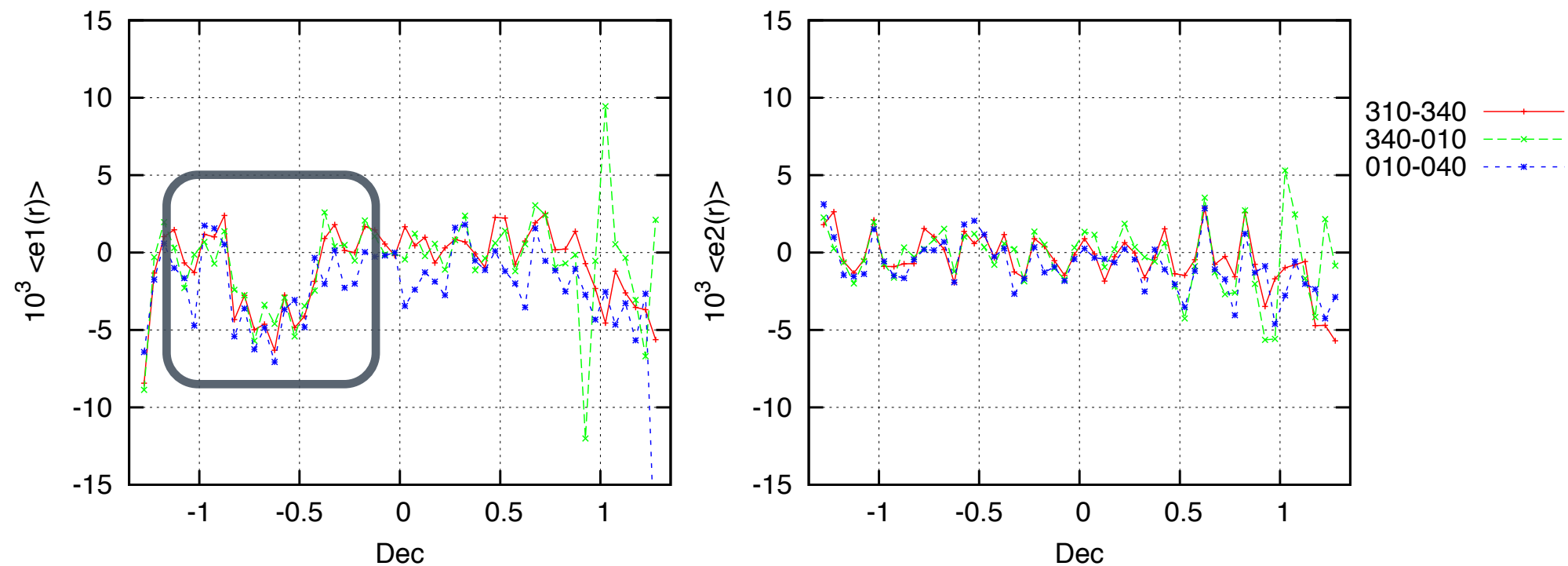


Huff et al. (2014)

Best explanation for this: nonlinearity correction  
in SDSS r2 CCD is wrong.



# Examples of instrumental effects



Huff et al. (2014)

Responsible for 2/3 of additive shear systematics in SDSS lensing analyses!

# In the context of other analysis issues...

- PSF correction / shear estimation: many methods, lots of effort (incl. ongoing, based on 2 decades)
- Astrophysical and theoretical uncertainties: lots of work for the past 2 decades
- Instrumental systematics: less well-explored than these in VL context. Lots to do!

# Conclusions

- Weak lensing science can do amazing things (dark energy, gravity, dark matter-galaxy connection)
- More work is needed on characterizing the impact of instrumental systematics!